

# Phase Problems for Multidimensional and Undersampled Data

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Workshop on New Approaches to the Phase Problem

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## OUTLINE

### Preliminaries

- Nyquist sampling
- "Oversampling"
- Aliasing, sampling, solvent volume

### Undersampled Data

- Effect of size & shape of support
- Effect of symmetry

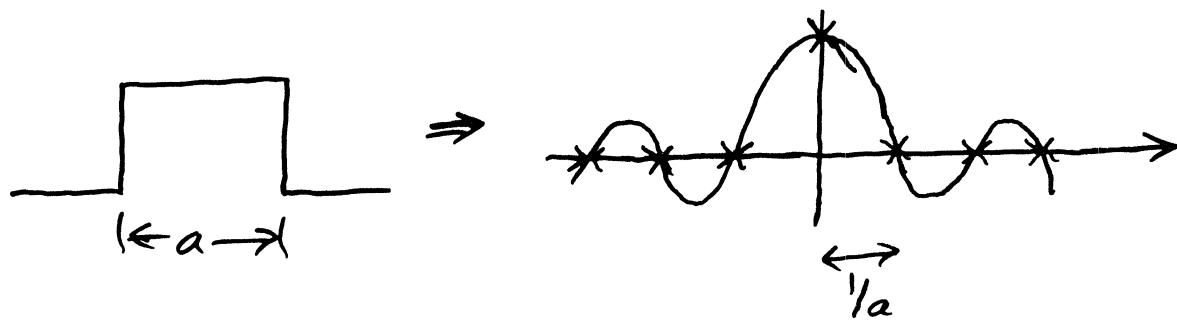
### Multidimensional (3D) case

- Uniqueness
- Sampling requirements
- Stability & convergence
- Fiber diffraction

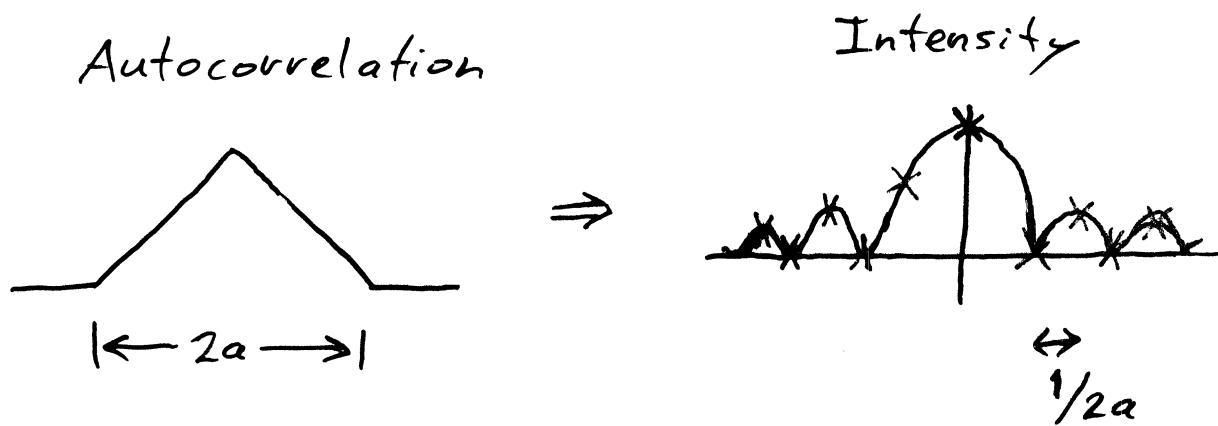
Application of the HIO algorithm to  
protein crystallography

## NYQUIST SAMPLING

Minimum sample spacing to reconstruct a band-limited signal.



$$\text{Support of image} = a \Rightarrow \text{Nyquist spacing} = 1/a$$



Use of term "oversampling"

Oversampling usually means ~~> Nyquist~~ Nyquist spacing

NOT  $<$  twice Nyquist spacing

If the spacing is  $>$  Nyquist we say that  
the signal is "undersampled".

### FOR PHASE RETRIEVAL

Is the continuous amplitude sufficient to  
uniquely recover the phase?

1D - no

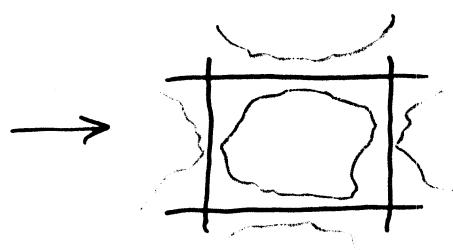
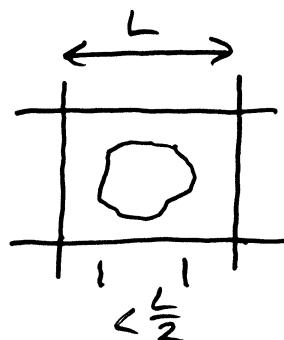
2D - yes

3D - more than sufficient  
by a factor of two

## ALIASING, SAMPLING & SOLVENT VOLUME

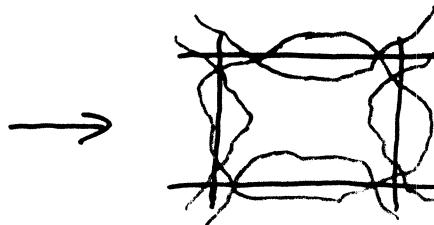
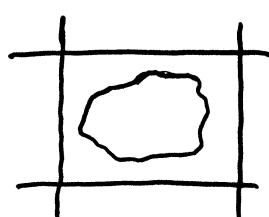
Aliasing  $\Rightarrow$  overlap of supports if the spectrum is undersampled.

Two dimensions



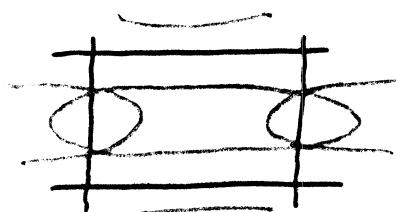
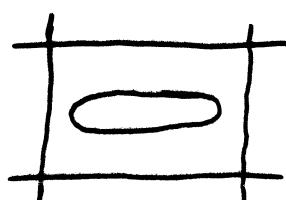
Sampling intensity at  $\frac{1}{L}$  is OK

$$\frac{V_{\text{molecule}}}{V_{\text{cell}}} < \frac{1}{4}$$



Sampling at  $\frac{1}{L}$  not OK

$$\frac{V_{\text{molecule}}}{V_{\text{cell}}} > \frac{1}{4}$$



$$\frac{V_{\text{molecule}}}{V_{\text{cell}}} < \frac{1}{4}, \text{ but}$$

Sampling at  $\frac{1}{L}$  is not OK

Error due to support being "too large"  
OR sample spacing being too large

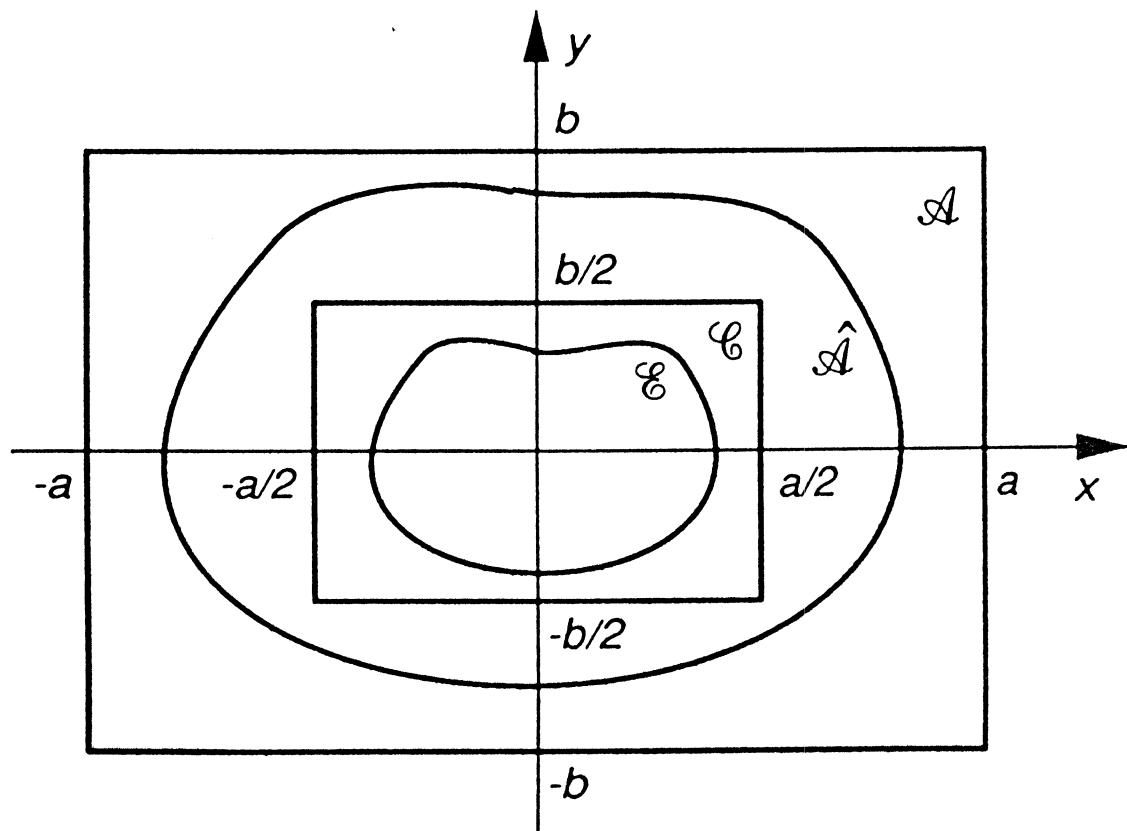
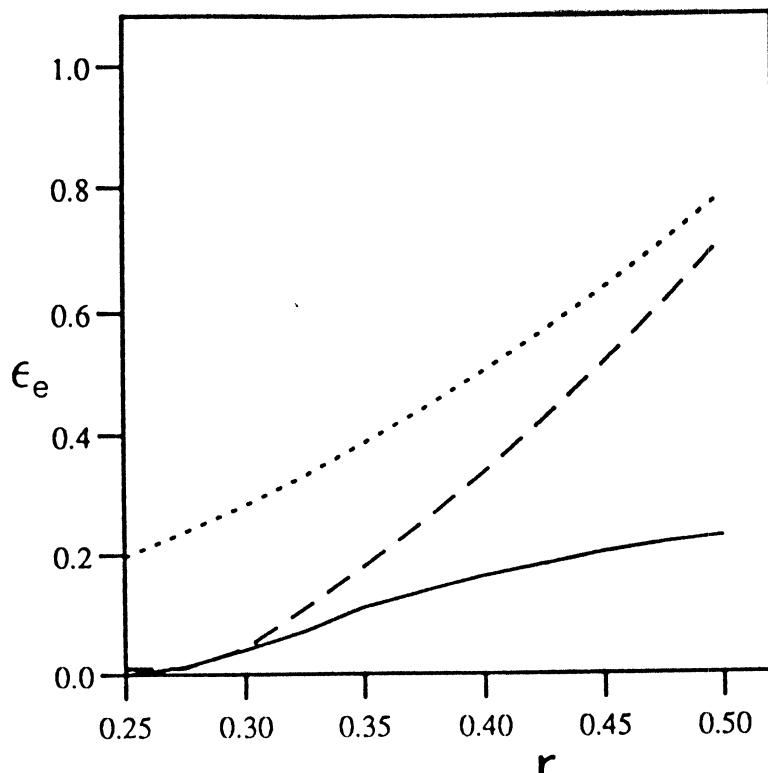
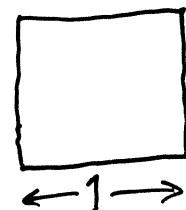


Fig. 1. Image space showing the regions  $C$ ,  $A$ ,  $\mathcal{E}$  and  $\hat{A}$  defined in the text.

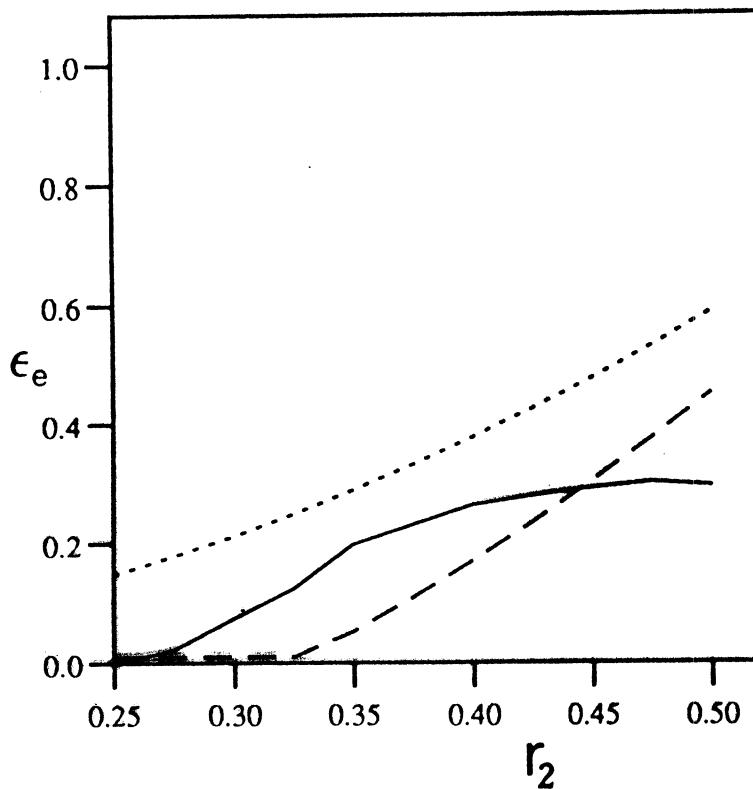
Aliasing  
error



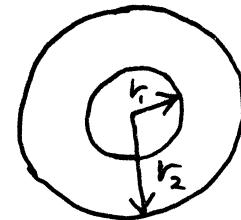
Circular  
support



(a)



Annulus



$$r_1 = \frac{r_2}{2}$$

(b)

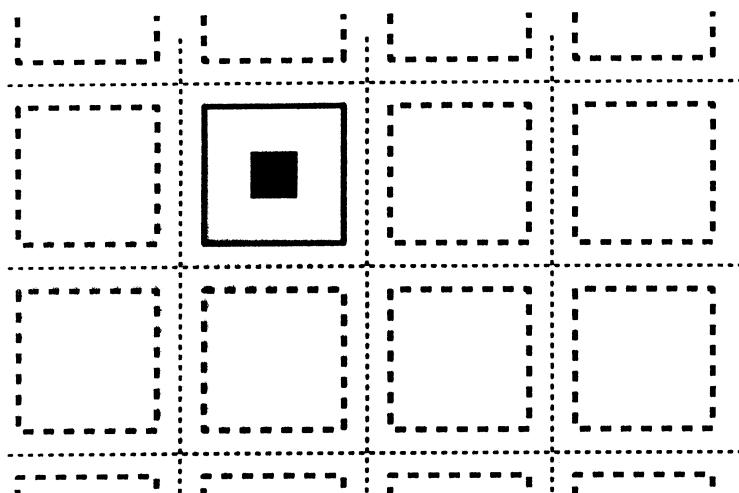
Fig. 4. Error metrics  $\epsilon_e^{(1)}$  (---),  $\epsilon_e^{(2)}$  (—) and  $\epsilon_e^{(3)}$  (···) for annular envelopes as a function of  $r_2$ , for (a)  $r_1 = 0$  and (b)  $r_1 = r_2/2$ .

# Constraints: symmetry

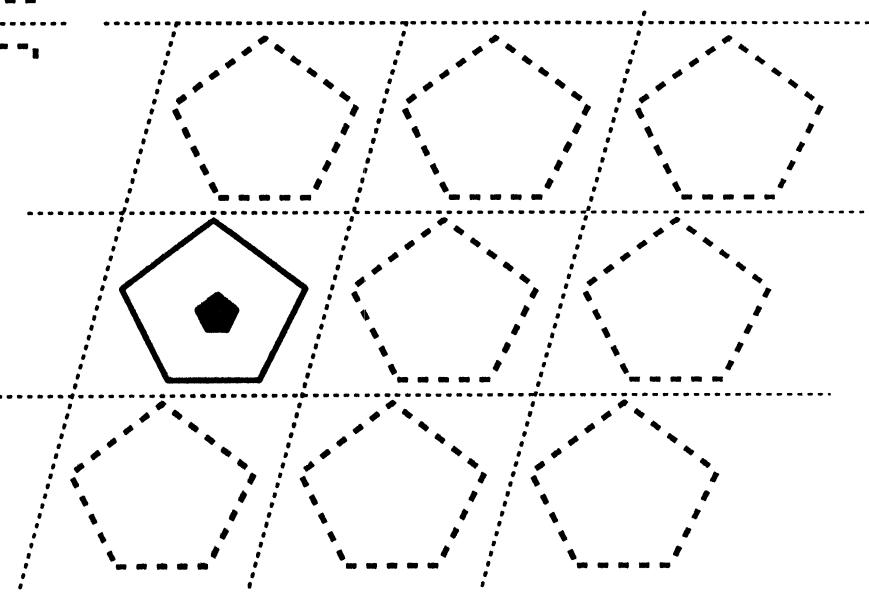
There are two type of symmetry: crystallographic and non-crystallographic symmetry.

Crystallographic symmetry holds true over the entire crystal and gives relationships between the data but it gives no new phase information.

Non-crystallographic symmetry only holds locally. It is not trivially contained the structure factors, and provides phase information



4-fold crystallographic symmetry



5-fold non-crystallo-graphic symmetry

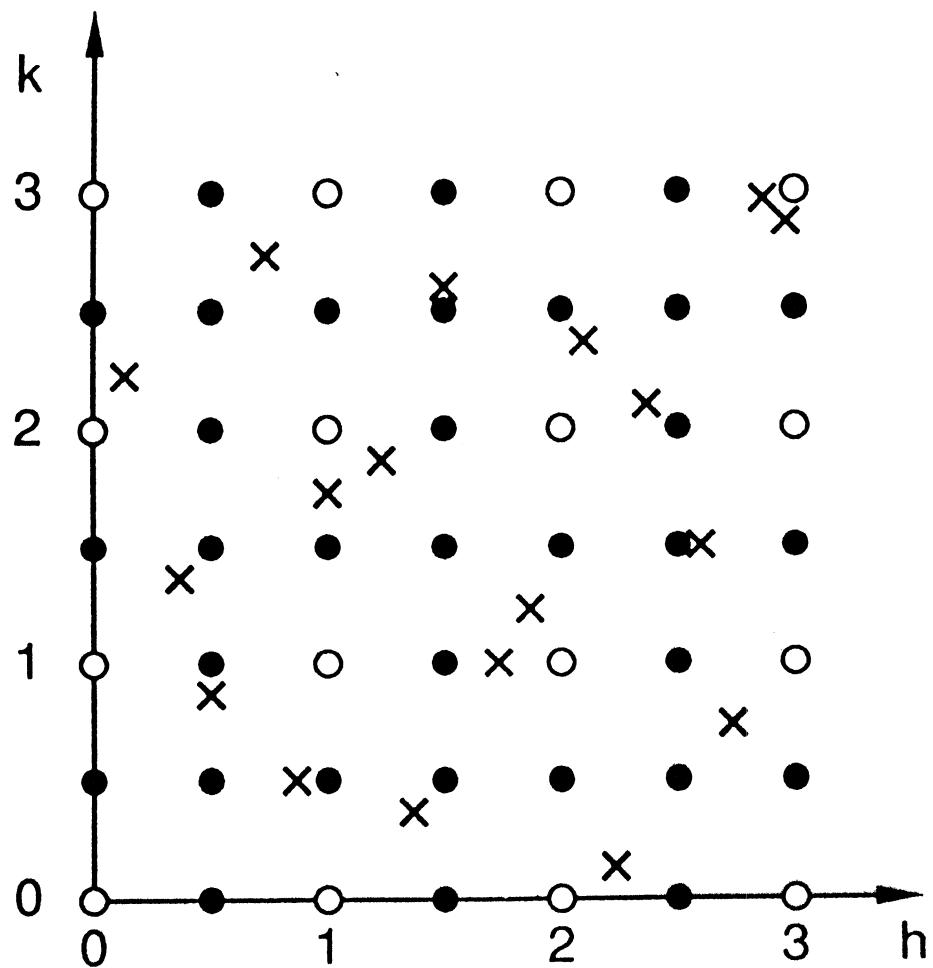


Fig. 2. One quadrant of reciprocal (Fourier) space showing the reciprocal lattice points ( $\circ$ ), the Nyquist sample points for  $|E(u,v)|^2$  ( $\circ$  and  $\bullet$ ), and the additional sample points that result from threefold noncrystallographic symmetry ( $\times$ ).

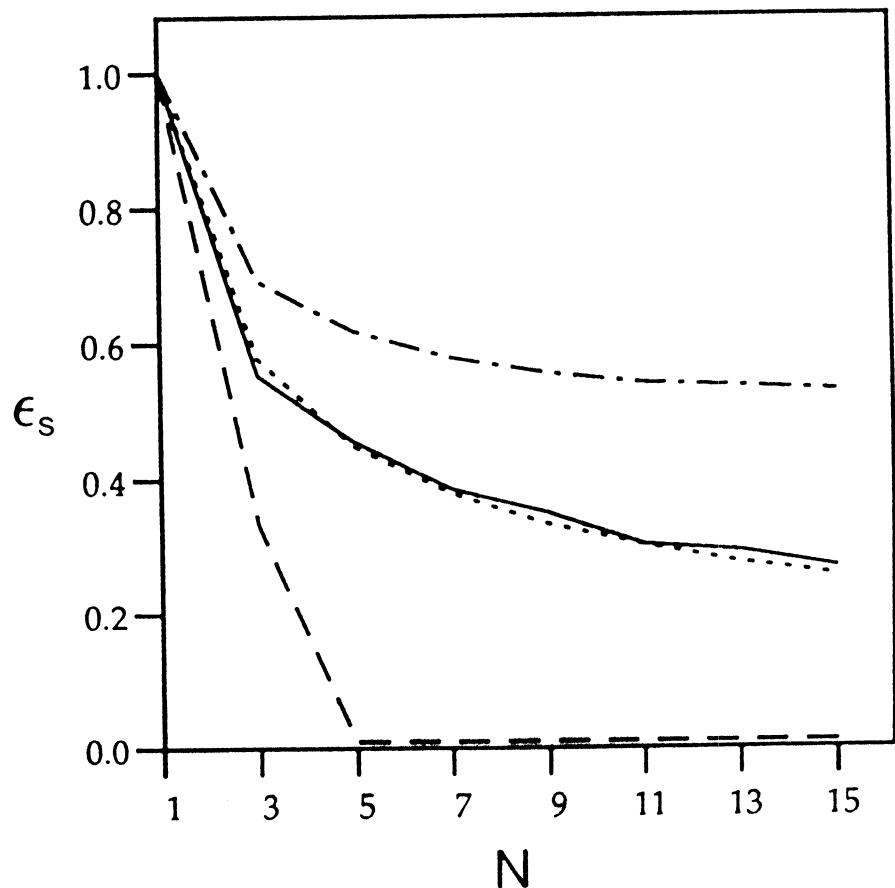
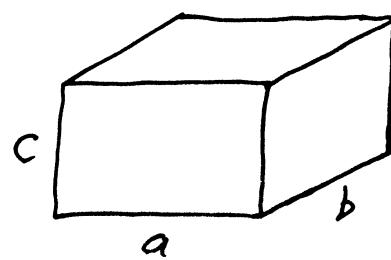
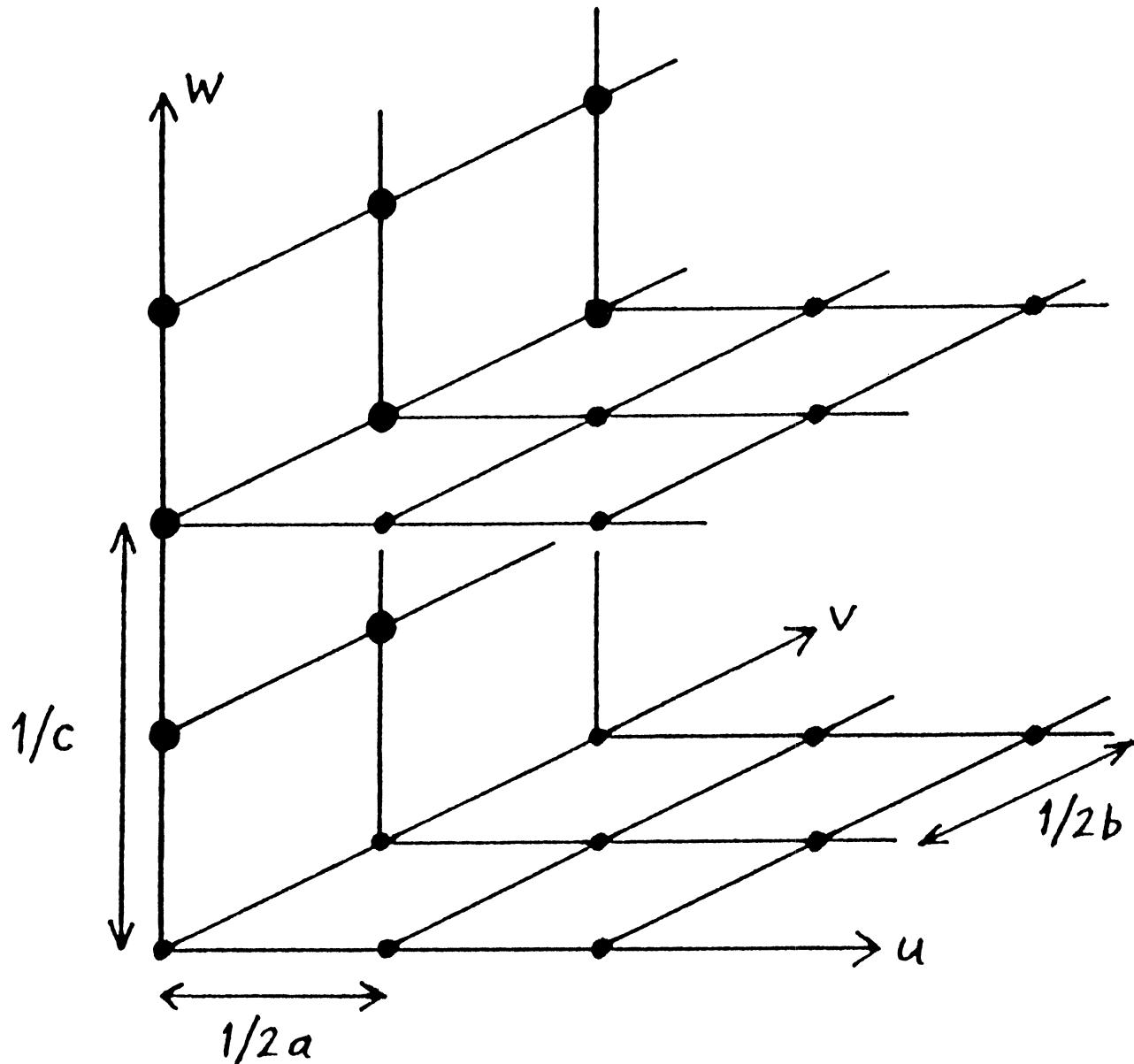


Fig. 7. Error metrics  $\epsilon_s^{(1)}$  (---),  $\epsilon_s^{(2)}$  (—),  $\epsilon_s^{(3)}$  (-·-·), and  $\epsilon_s^{(5)}$  (···) as a function of  $N$ .

# MULTI DIMENSIONAL CASE

Millane, J. Opt. Soc. Am. A, 13, 725-734 (1996).

3-D case:



2D       $8 \times 8$  image

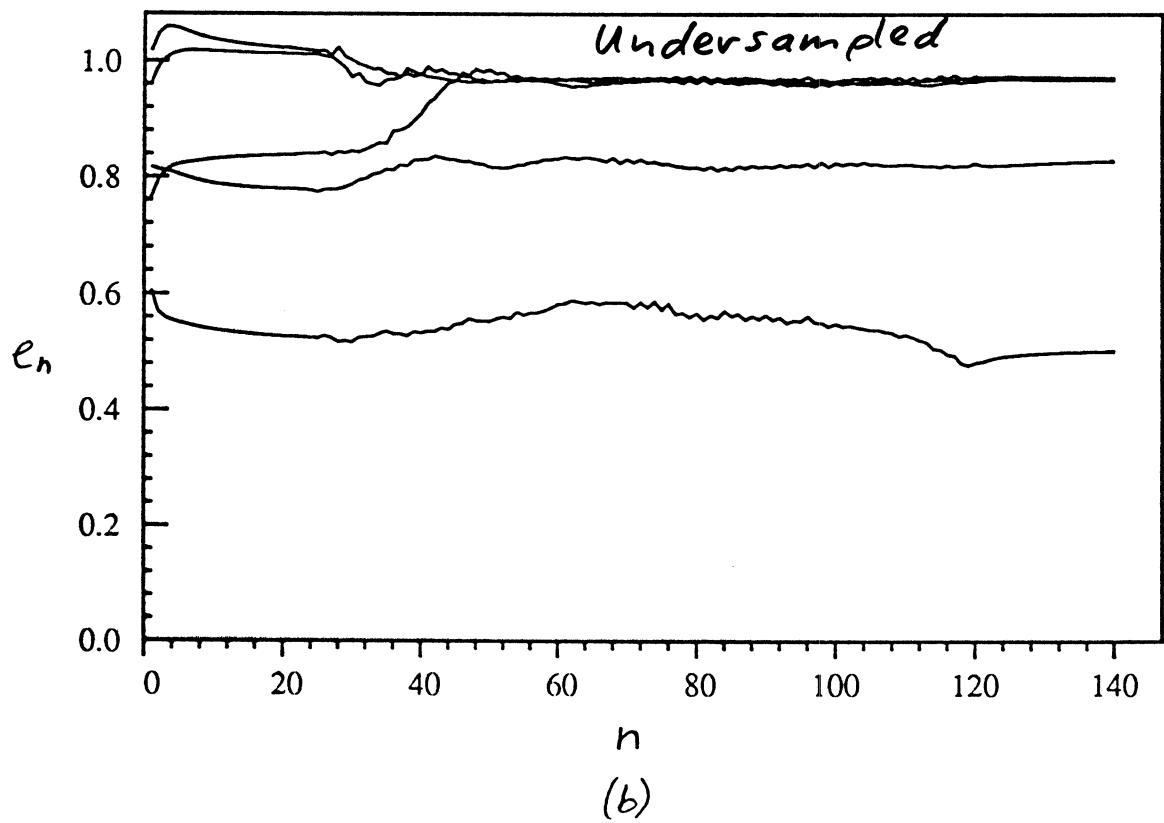
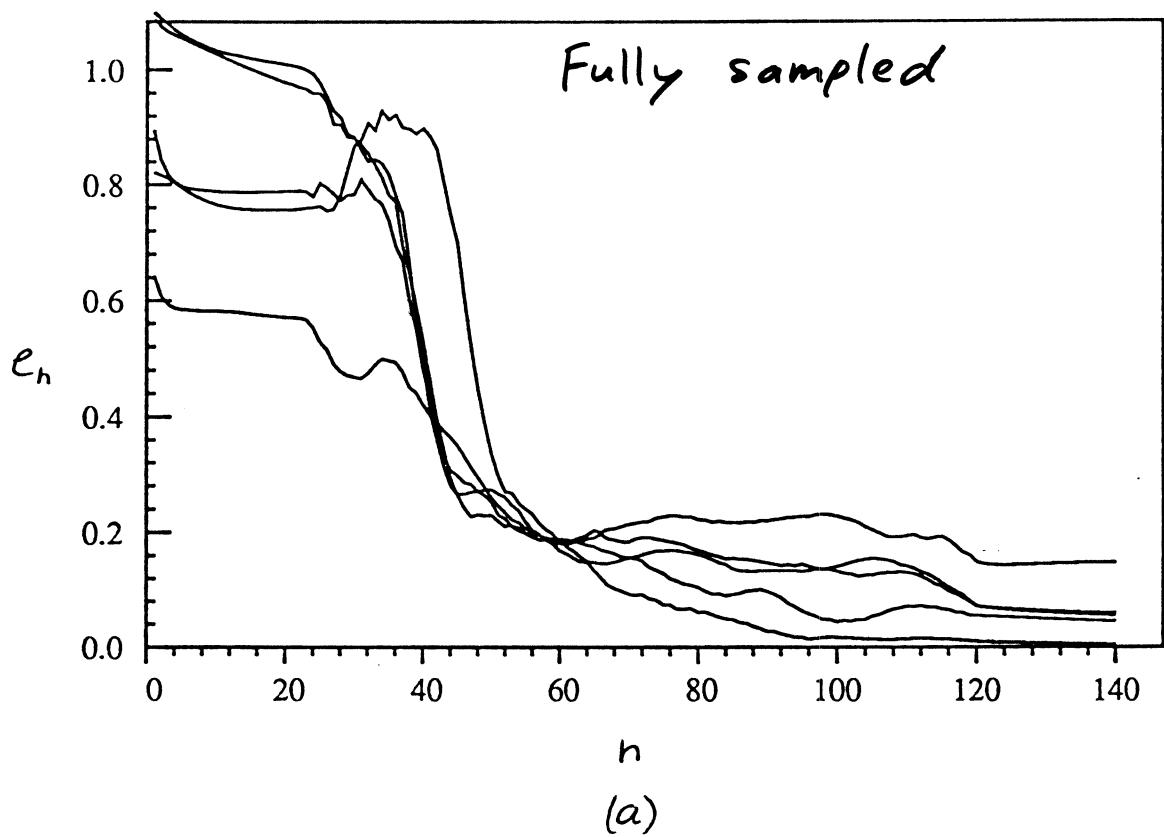


Fig. 2

3D       $8 \times 8 \times 4$  image

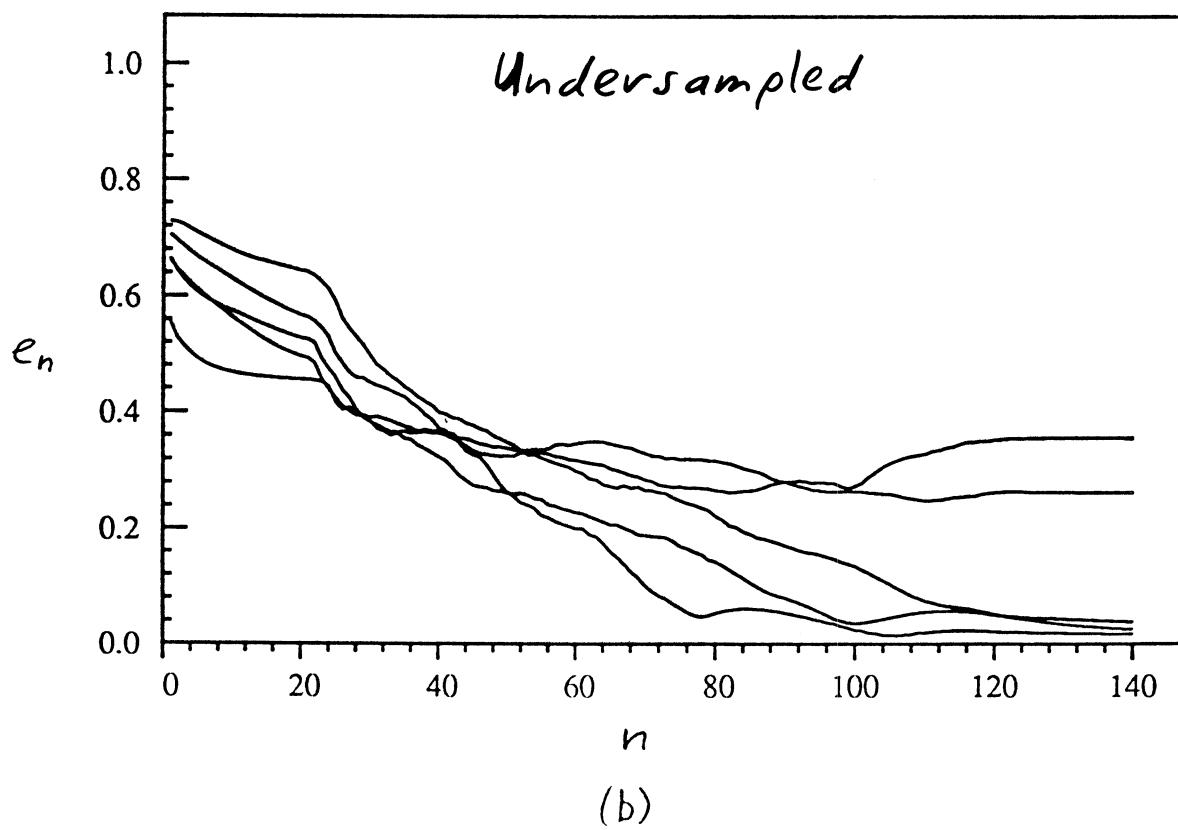
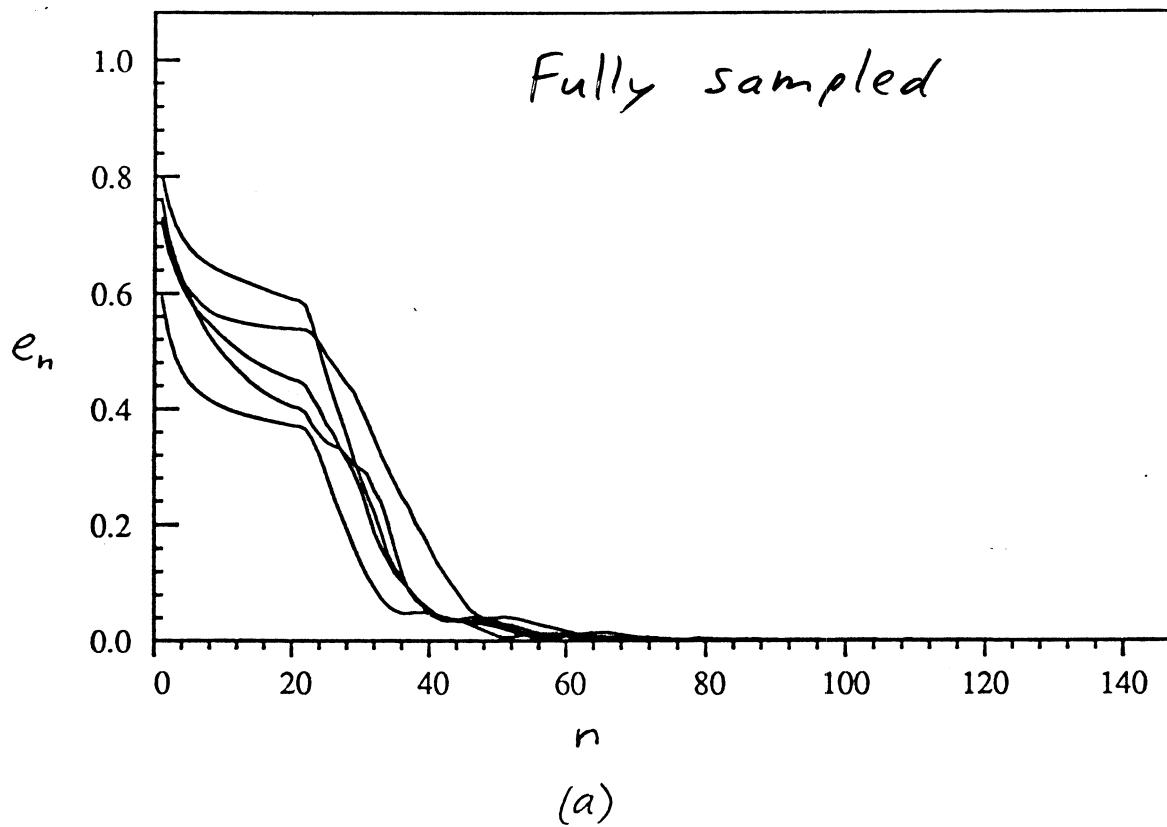
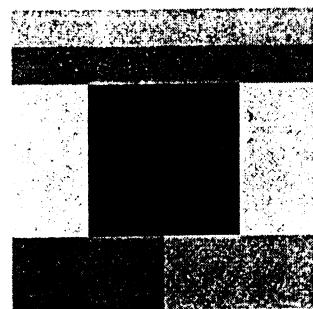
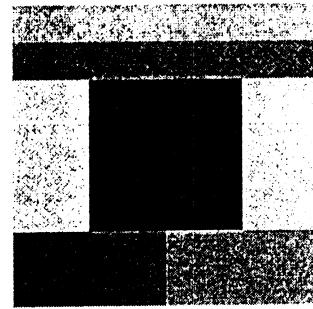


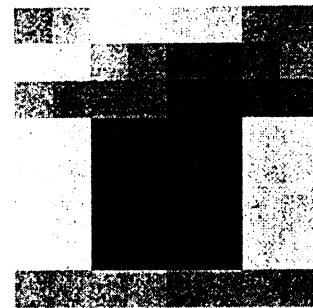
Fig. 1



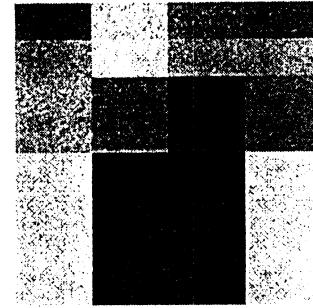
(a)



(b)

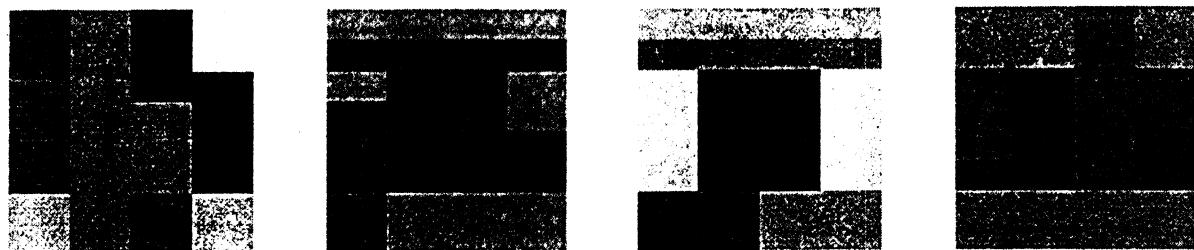


(c)

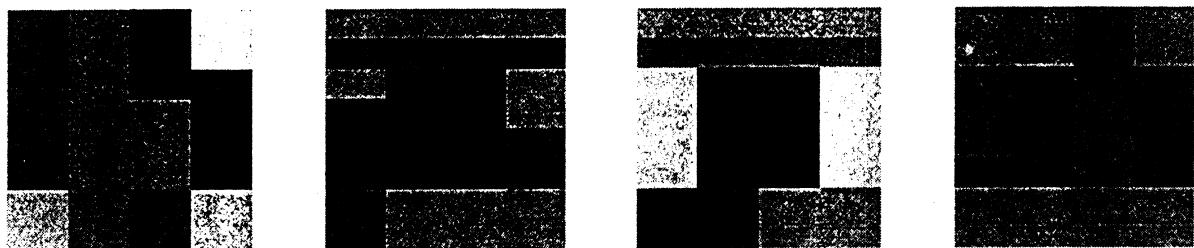


(d)

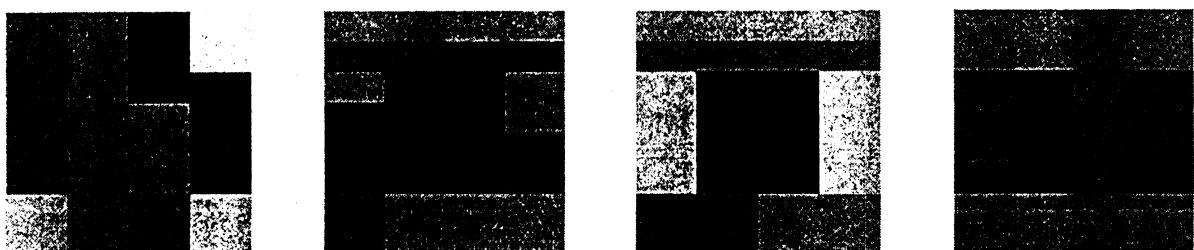
Fig. 4



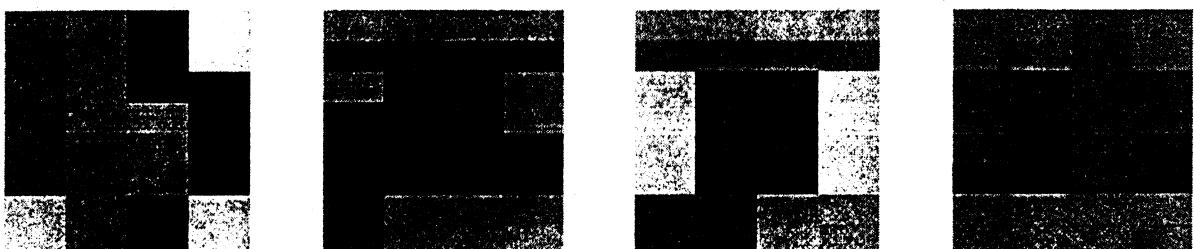
(a)



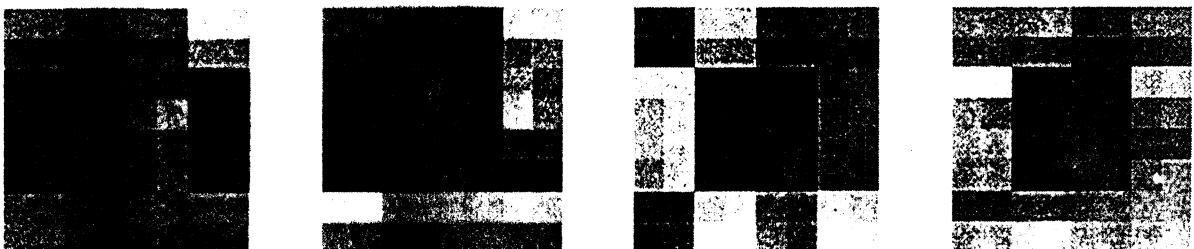
(b)



(c)



(d)



(e)

Fig. 3

## THREE-DIMENSIONAL CASE

Fully sampled data

- Phase problem is overdetermined
- Phase retrieval is more stable
- Faster convergence

Undersampled data (up to a factor of two)

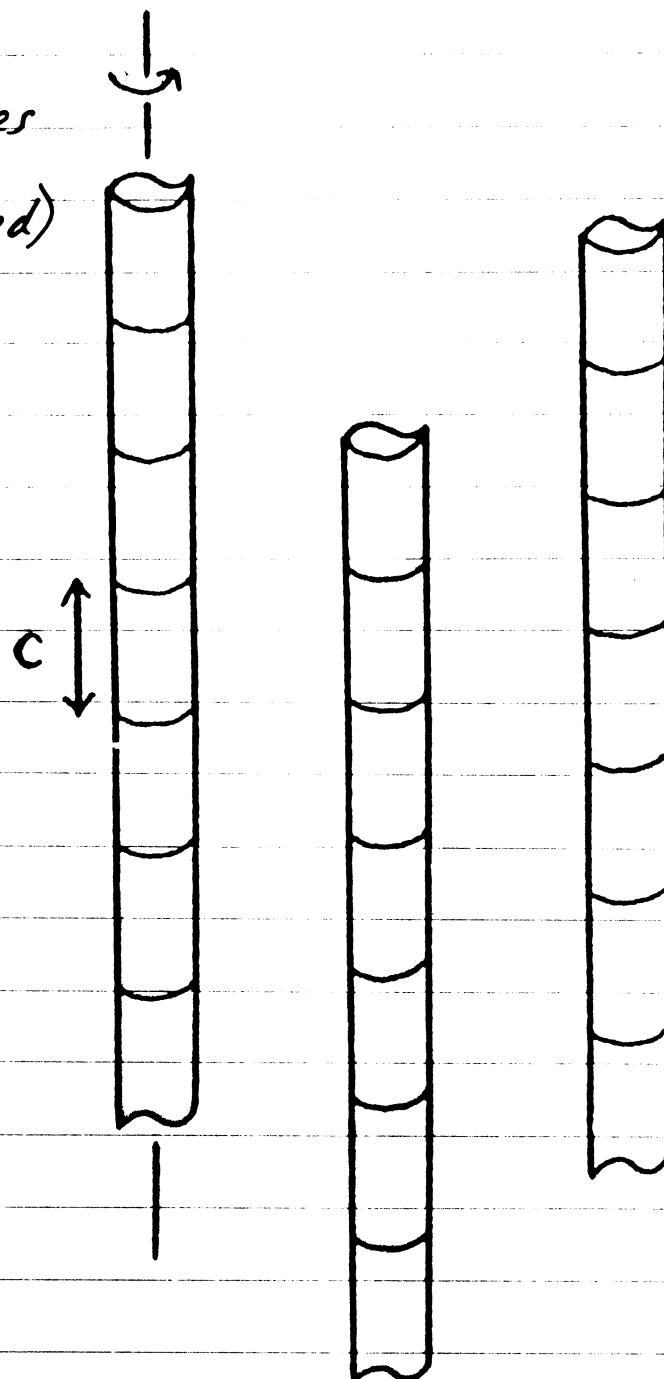
- Phase problem is still unique
- Conventional algorithms are effective

# FIBER DIFFRACTION

Periodic particles

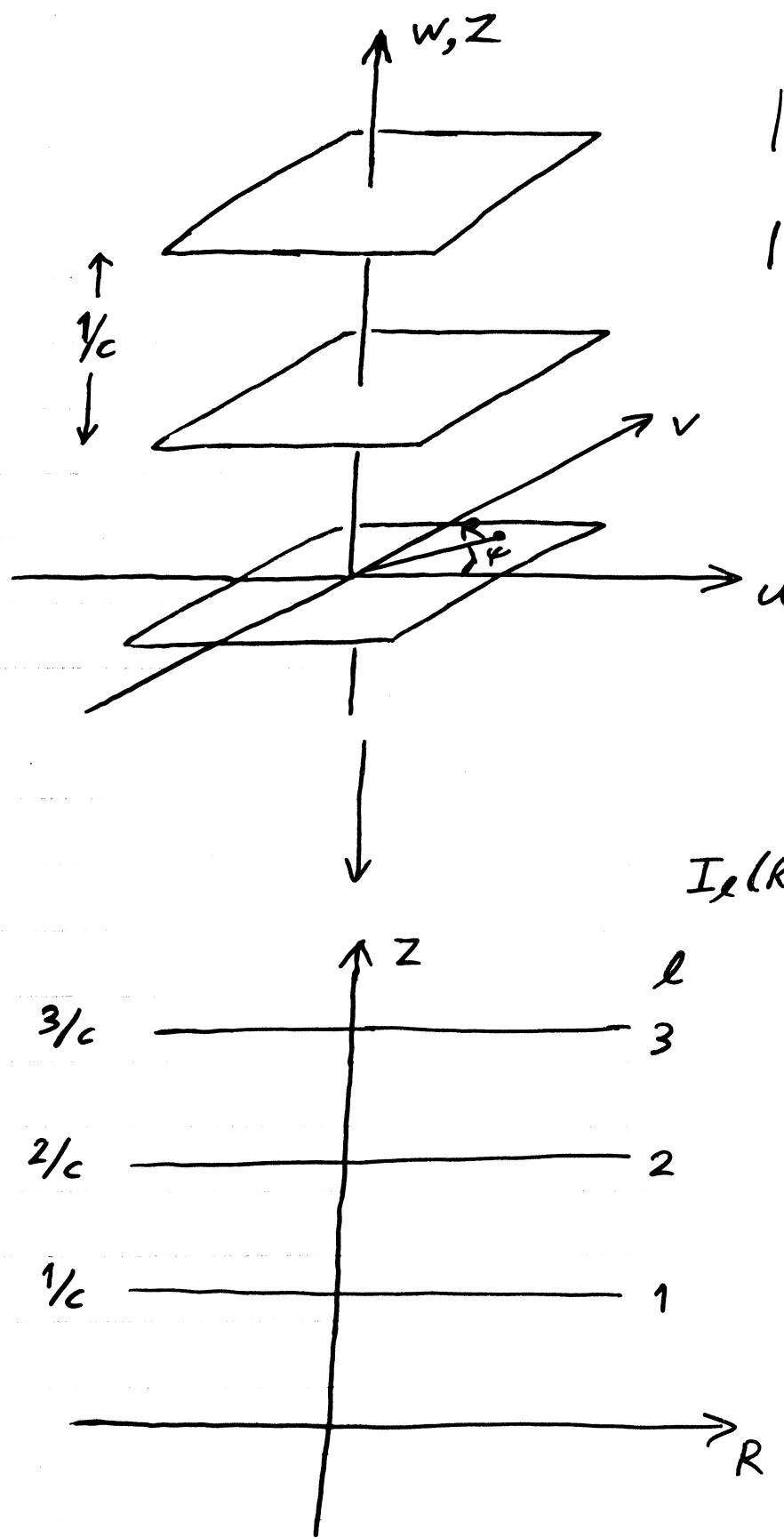
Aligned (oriented)

Cylindrically  
disordered



Electron density (image)  $f(r, \phi, z) \leftrightarrow$

Fourier transform  $F(R, \psi, z) \rightarrow F(R, \psi, \frac{z}{c})$



$$|F(u, v, \frac{r}{c})|^2$$

$$|F(R, \varphi, \frac{r}{c})|^2$$

$$I_\ell(R) = \int_0^{2\pi} |F(R, \varphi, \frac{r}{c})|^2 d\varphi$$

$$= \sum_n |G_{n\ell}(R)|^2$$

# APPLICATION OF THE HIO ALGORITHM TO PROTEIN (VIRUS) CRYSTALLOGRAPHY

Ab initio phasing

Underdetermined by a factor of four

Applied to an icosahedral virus that has  
five-fold noncrystallographic symmetry

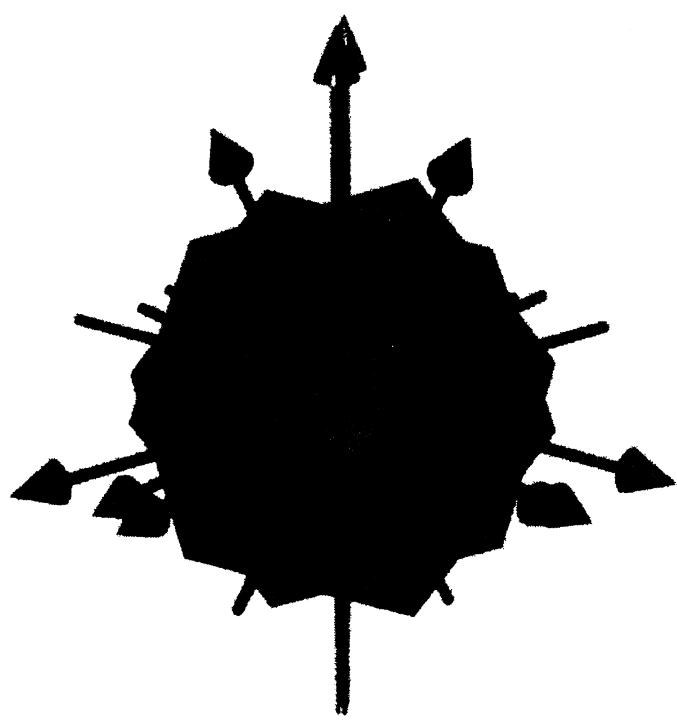
Virus diameter =  $320 \text{ \AA}^{\circ}$

Cubic unit cell of dimensions  $350 \text{ \AA}^{\circ}$

Constraints: Spherical support of  $340 \text{ \AA}^{\circ}$  diameter

5-fold noncrystallographic symmetry

Positivity



# The simulation

We used synthetic data from the cowpea mosaic virus (cpmv), an icosahedral virus with a 320 Å diameter.

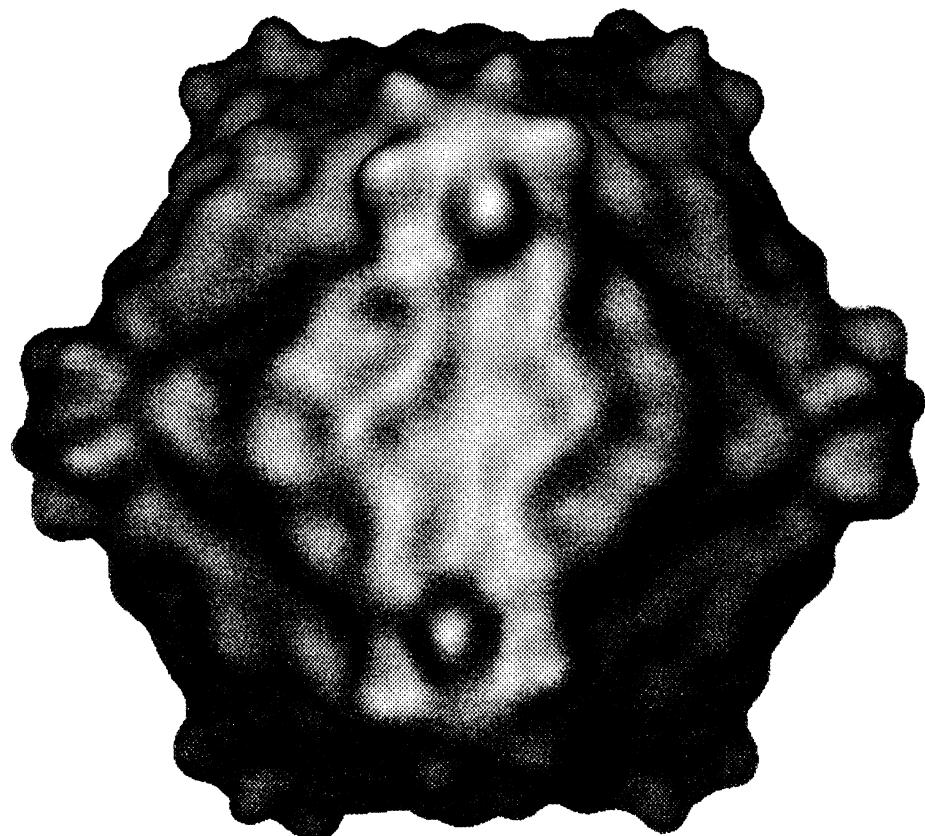
Synthetic data:

- \* 5% (S/N) noise
- \* reflections up to 100 Å missing

Two refinements:

- \* just ER cycles (reference)
- \* combination of ER and HIO

From 20Å to 8Å resolution



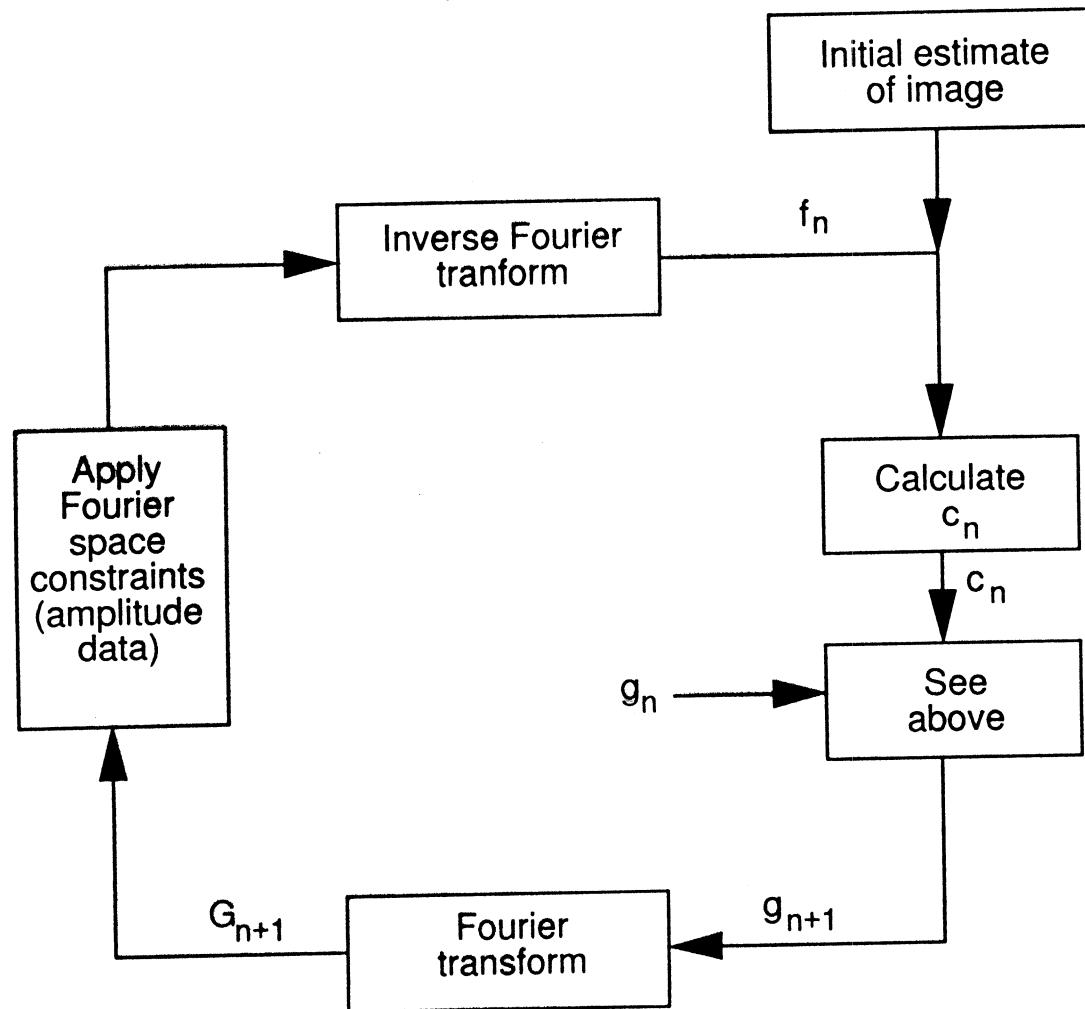
# HO Algorithm

Millane & Stroud, J. Opt. Soc. Am. A, 14, 568-579 (1997)

The hybrid input/output algorithm uses both the constraint values and the estimate from the previous iteration to improve the image

The object is to drive the reconstruction from fixed points of the er algorithm

$$g_{n+1}(x) = f_n(x) \quad \text{if } f_n(x) = c_n(x) \\ = g_n(x) - \beta (f_n(x) - c_n(x)) \quad \text{otherwise}$$



# **Phase extension**

Reconstruct image at low resolution

Include higher resolution amplitudes with random phases and reconstruct higher resolution image.

Keep ‘stepping out’ in resolution bins until maximum resolution is reached.

# **Missing reflections**

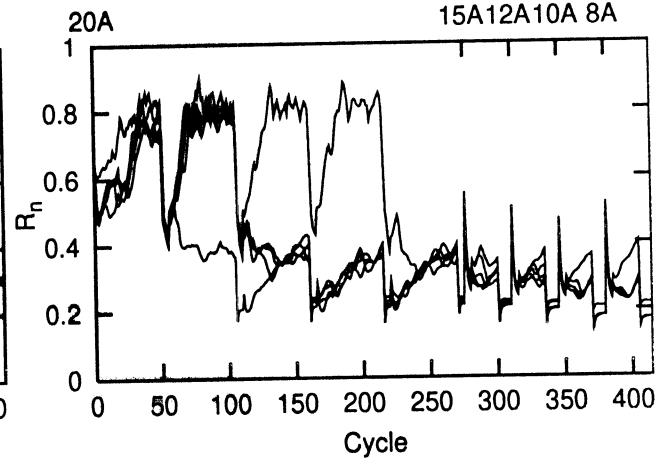
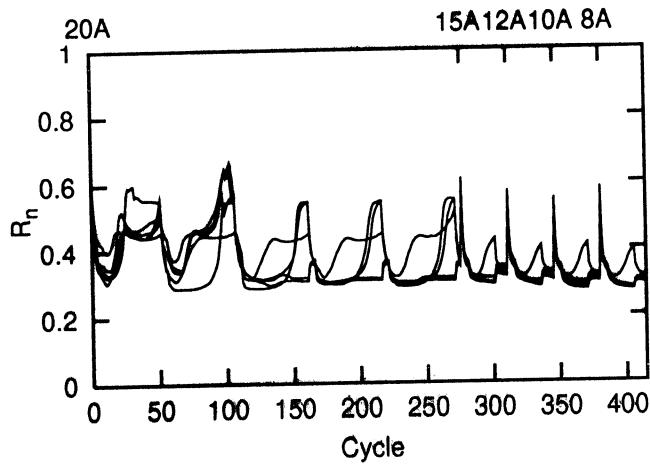
Often the low order reflections are not measured

Obtain initial estimates of the amplitudes from the mask

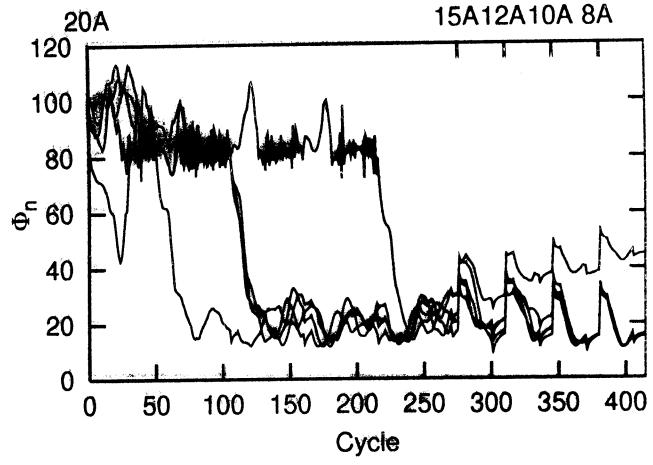
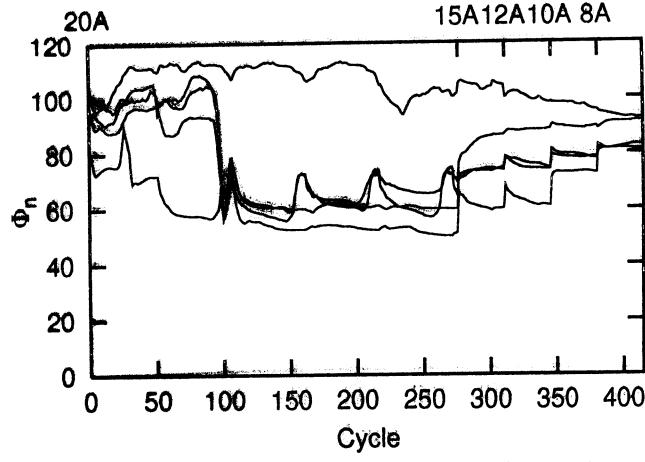
Optionally update these during refinement from (improved) electron density estimates.

# Results (error metrics)

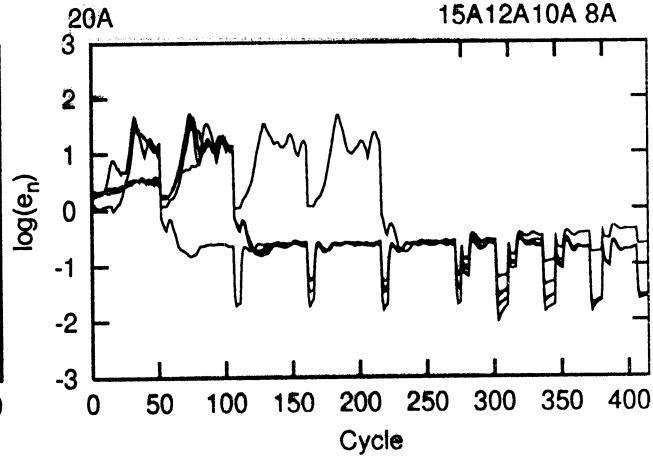
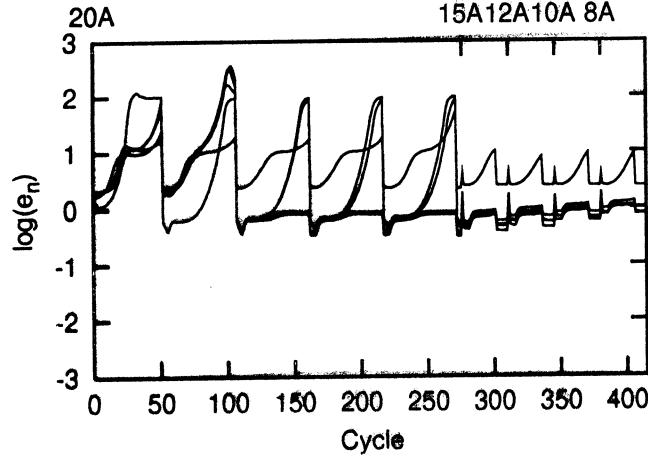
R-factor



Phase Error



RMS Error

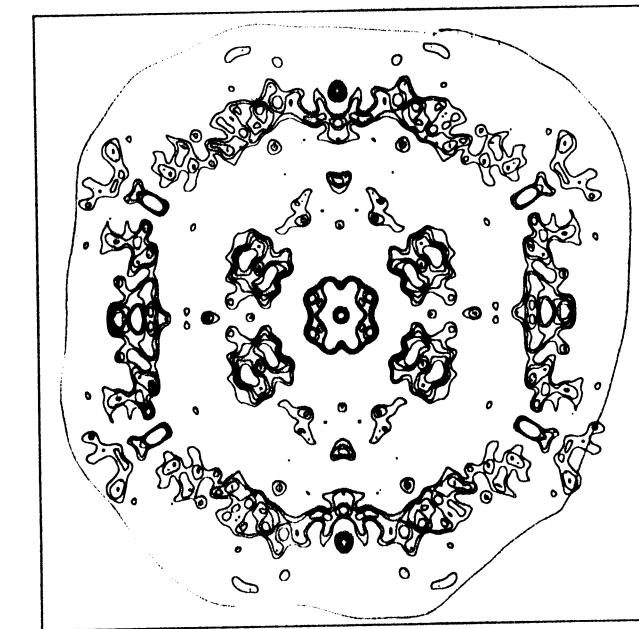


ER

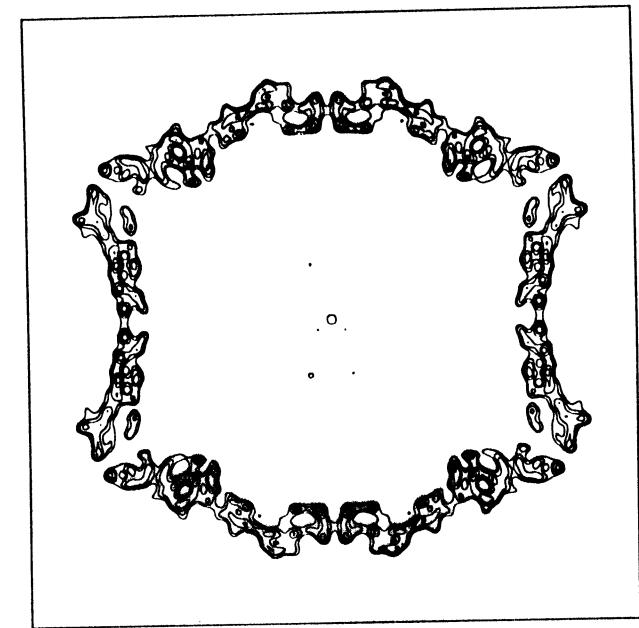
11

HIO

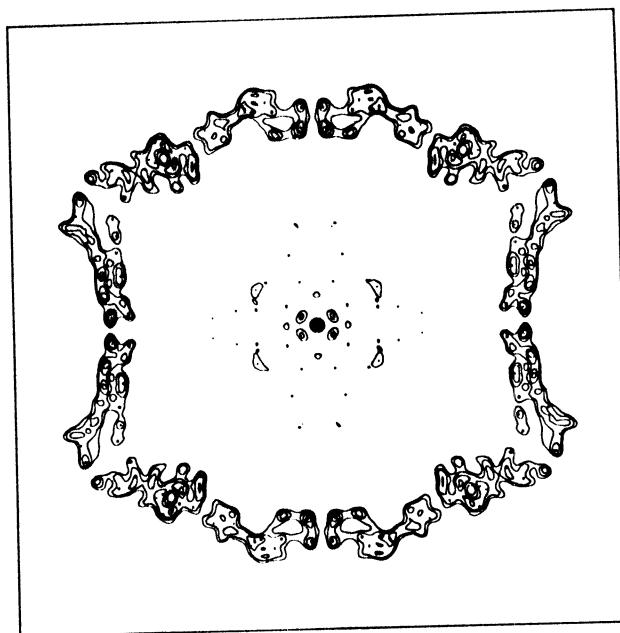
# Results: contour plot



ER



True Image



HIO